



Understanding aroma release from model cheeses by a statistical multiblock approach on oral processing

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coating the pharynx [7] allowing the validation of the influence of saliva dilution. All these approaches using mechanistic models need to be confronted with experimental data, which are not always available. More recently an extension of the model developed by Doyennelle *et al.* [7], was developed [8] by taking account of the mastication process during cheese consumption and the simulations issued from the model were compared to experimental data on ethyl propanoate (EP) release from cheeses previously obtained [9]. This mechanistic approach allowed highlighting that among the different parameters of the model, saliva incorporation into the bolus, duration of mastication and velopharynx opening had a major influence on the overall kinetics of aroma release. However, these parameters were not measured but calculated with the model and used as degree of freedom of the model for simulations. Moreover, the model was not able to fit the release curves obtained for a more hydrophobic aroma, nonan-2-one (NO). This was explained by a possible retention of this molecule by lubricated mucosa, which was not taken into account in the model.

By contrast to these deterministic approaches, an empirical modelling approach consists in performing statistical treatments on different data sets in order to explain flavour release. In this context, Partial Least Square (PLS) regression analysis is among the most used strategy of analysis to investigate the relationships among groups of variables. For instance this approach was successfully applied to explain fatty acid threshold perception in human by means of oral physiological characteristics [10]. PLS regression fits within the general framework of multiple linear regressions. It can also be seen as an extension of this framework to investigate the relationships between two blocks of variables: a block of response variables and a block of predictor variables. One of its main advantages is to efficiently deal with highly correlated variables even in situations where the number of variables largely exceeds the number of individuals. Obviously, this is a common occurrence in biomedical and biological studies. Another occurrence in this kind of studies is the presence of more than two blocks of variables. Very often, practitioners overlook this structure of the data and undergo separate PLS regression analyses on pairs of blocks. A more appropriate strategy of analysis is to undergo Multi Blocks-Partial Least Square (MB-PLS). The rationale behind this method of analysis is to generate latent variables (or components) from the response variables that are highly related to latent variables from the other blocks of predictive variables. More precisely, the latent variables in each block are computed as linear combinations of the variables of that block. MB-PLS aims at finding, step by step, underlying directions (i.e. components) in the response variables that are as much related as possible to components in the predictive block of variables [11–19]. Moreover, MB-PLS highlights the importance of each block in the prediction of the response variables. In the literature, MB-PLS approach has been described in some omics studies conducted with multitargeted approaches such as proteomic and metabolomics [20]. Up to our knowledge, in the field of food science, this statistical approach has not been widely disseminated within the scientific community though researches in the field lead to different data sets (sensory, physico-chemistry, physiology). However, recent studies use the PLS or the PLS –discriminant analysis (PLS-DA) to evaluate tomato liking [21], cheeses quality [22], or for linking gas chromatography – mass spectrometry (GC-MS) and proton transfer reaction – time of flight – mass spectrometry (PTR-TOF-MS) fingerprints of food samples [23].

In the present study, we propose to investigate, on well characterized subjects, the relation between aroma release during cheese consumption and different blocks of data corresponding to

different characteristics of the oral processing events that can be involved in aroma release. Unlike the deterministic approach based on a mathematical analysis and modeling, we propose an empirical approach based on MB-PLS analysis. This approach will make it possible to prioritize the different blocks of variables involved in aroma release and to identify the most important variables within each block.

Materials and Methods

The study protocol was submitted to an Ethics Committee and was approved on 17 April 2008 by the Comité de Protection des Personnes Est-1 (N°2008/15) and on 8 August 2008 by the Direction Générale de la Santé - France (N° DGS2008-0196).

A short summary of experimental plan is presented in Table 1.

Subjects

Forty eight subjects (23 females and 25 males aged between 22 and 60 years; average age: 40 years) participated to this study. Subjects were selected from a group of 100 volunteers based on their good dental and oral status (no missing teeth – except third molar, no occlusion disorder, no xerostomia, no medications that may impact saliva flow and composition), and on the repeatability of measured physiological parameters (salivary flow rate under resting and stimulated conditions, respiratory flux, salivary composition) [24] [25].

The subjects were not allowed to smoke, eat or drink starting one hour before the test session. All the subjects were informed of the observational nature of this study. They gave their signed consent and received a financial compensation for their participation to two sessions, each lasting about two hours.

Panel oral physiological variables are shown in Table 2.

Cheese products

Four processed model cheeses were designed with the following ingredients: cheddar, soft cheese, butter, melting salts, protein powder (casein), salt and water. Different textures were obtained by varying the water content (S = soft, F = firm) and varying the ratio of fat to dry matter from 25% for low fat cheeses (lF and lS) to 50% for high fat cheeses (hF and hS). The pH ranged from 5.27 to 5.55. The rheological properties of the cheeses were measured in a large deformation at a rotation of 0.01 rad.s^{-1} for 240 s using a Haake Viscotester (VT550 – Thermo electron GmbH, Karlsruhe, Germany). The breakdown stress (BS) corresponds to the maximum strength necessary to cause cheese breakdown, with the lowest values for the softest cheese (respectively 8129 ± 469 and 8022 ± 1309 Pa for lS and hS) and the highest values for the firmest cheese (respectively 15253 ± 1231 and 15556 ± 2307 Pa for lF and hF). The critical strain at breakdown (CSB) corresponds to the maximum rotation angle required to cause breakdown, with the lowest values for cheeses with the highest fat content (respectively 0.273 ± 0.022 and 0.348 ± 0.061 rad for hS and hF), and the highest values for cheeses with the lowest fat content (respectively 0.804 ± 0.056 and 0.836 ± 0.036 rad for lS and lF).

Model cheeses were flavoured with two aroma compounds differing in terms of their hydrophobicity (logP): nonan-2-one (NO: logP = 2.9) and ethyl propanoate (EP: logP = 1.4). They were added during cheese production at levels adjusted to achieve final concentrations in the cheeses around 6 mg.kg^{-1} for nonan-2-one and 25 mg.kg^{-1} for ethyl propanoate.

Table 1. Overview of the experimental design of the study and the corresponding code for the cheese products.

Number of Subject	48 (25 men and 23 women)
Molecules (Ions) followed by APCI: abbreviation	Ethyl Propanoate (103): EP; Nonan-2-one (143): NO
Cheese product consumed	lfs : low fat, Soft; lff : low fat, Firm; hfs : high fat, Soft; hff : high fat, Firm

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In vivo aroma release measurement

In vivo aroma release was monitored as previously described [26] using Atmospheric Pressure Chemical Ionisation-Mass Spectrometry APCI-MS (ion trap Esquire-LC mass spectrometer, Bruker Daltonique, Wissembourg, France). Air was sampled from the nose at an average flow rate of 37 mL.min⁻¹ via a fused silica capillary tubing (i.d. = 0.53 mm) heated at 150°C and to which a 5 kV positive ion corona pin discharge was applied. The two aroma compounds added to the model cheeses were monitored simultaneously according to their protonated molecular ion (MH⁺): ethyl propanoate (m/z = 103) and nonan-2-one (m/z = 143). Each subject was asked to position the plastic tube in one nostril (the same for all the experiments) and to breathe normally. This period (breath-blank phase) was used to record the potential residual signal of the previous sample until return to the baseline and to control the regularity of breathing. Subjects were instructed to place the piece of cheese ([2.25*2.25*1.1] cm; m = 6 g) in the mouth, and freely consume it while keeping the lips closed. The products were presented in a random order at 17°C. The temperature of the food bolus was measured before swallowing. The average temperature was of 35°C ± 2°C whatever the cheese and subject. All measurements were done in triplicate. Bread, apple and water were used as mouth cleansers between two tests.

After smoothing the curves to eliminate signal fluctuations due to the subjects' breathing patterns, two release phases were identified (Figure 1). The chewing phase (1) extended from placing the cheese in the mouth to the first swallowing, and the post-swallowing phase (2) extended from the first swallowing to the time at which the signal returned to its baseline level. For both release phases and for each aroma compound, three main parameters were extracted from each individual release curve: the area under the curve (A (a.u. : arbitrary unit)) representing the quantity of aroma released, the maximum intensity (Imax (a.u.)), the time to reach maximum intensity (Tmax (min)), the release rate (Imax/Tmax (a.u./min)) and the ratio of the quantity of aroma released between the two phases (A1/A2).

Chewing activity

Chewing activity was monitored during cheese consumption, simultaneously to aroma release. The muscle activity of the superficial masseter and temporis muscles (left and right) during chewing was recorded by electromyography (EMG) using gold surface electrodes (Grass technologies, West Warwick, RI, U.S.A), at 382 Hz, then the signal was amplified and digitalized, as already described by Mioche *et al.* [27]. Number of chewing cycles (Nb_cycle), chewing duration (Chew_time expressed in s), mean amplitude of contraction (Ampl. Expressed in mV) and total

Table 2. Oral physiological characteristics of the 48 subjects included in the study: Descriptive statistics.

Variables (unit)	Variables code in PLS projections	1 st Quartile	Median	3 rd Quartile	Mean	Standard deviation (n-1)
Salivary flux (ml/min.)	Sf_R	0.324	0.42	0.618	0.472	0.193
	Sf_S	1.79	2.37	3.4	2.57	1.06
Protein (mg/ml)	Prot_R	0.379	0.501	0.721	0.592	0.347
	Prot_S	0.865	1	1.21	1.04	0.31
Lipolysis (mU/ml)	Lipolysis_R	0.047	0.123	0.279	0.182	0.188
	Lipolysis_S	0.065	0.12	0.15	0.117	0.077
Amylase (U/ml)	Amylase_R	8.14	13	18.4	16.2	12.6
	Amylase_S	16.3	21.4	28.8	22.6	11
Lysozyme (U/ml)	Lysozyme_R	584	663	693	644	115
	Lysozyme_S	481	565	657	560	158
Proteolysis (U/ml)	Proteolysis_R	0.025	0.059	0.082	0.141	0.274
	Proteolysis_S	0.088	0.099	0.13	0.143	0.177
Sodium content (mM)	Na_R	2.08	2.88	4.08	3.31	1.99
	Na_S	7.61	11.7	18.5	14.5	9.8
Potassium Content (mM)	K_R	19.2	22.3	23.9	22.3	4.2
	K_S	15.2	16.7	19.1	17.4	3.15
Oral volume (cm ³)	Oral_vol.	28.8	36.9	45.5	38.6	10.5

n = 48; R: resting, S: stimulated.

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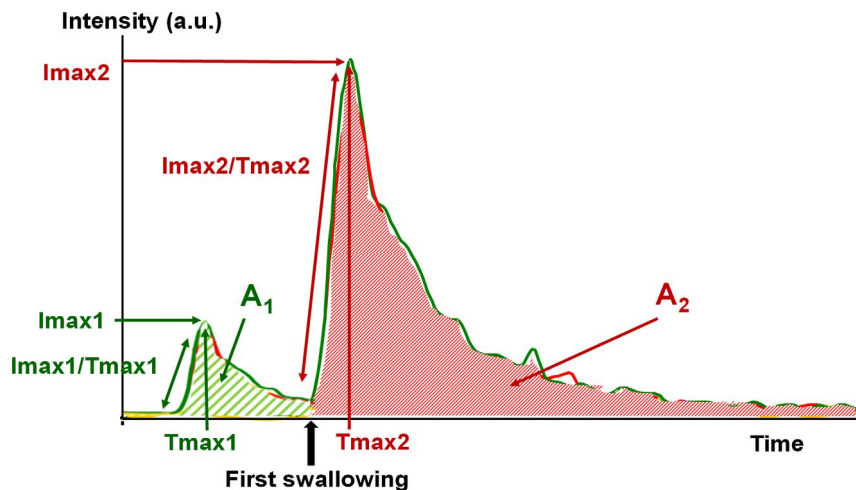


Figure 1. Typical aroma release curve profile. The release profile was separated in two release phases: before (phase 1) and after (phase 2) first swallowing. The quantity of aroma released (A_1 & A_2), the maximum intensity ($I_{\max 1}$ & $I_{\max 2}$), the time to reach maximum intensity ($T_{\max 1}$ & $T_{\max 2}$) and the release rate ($I_{\max 1}/T_{\max 1}$ & $I_{\max 2}/T_{\max 2}$) were extracted from the curve for each release phase.
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muscle work (W_{total} expressed in $\text{mV} \cdot \text{s}^{-1}$) were calculated from EMG data. Mean amplitude of contraction (Ampl.) corresponds to a mean calculated from the amplitude values of each chewing cycle registered in a whole chewing sequence [24].

Bolus saliva content

The percentage of dry matter and water content were determined using an infrared dryer for all the cheeses and boluses obtained just before swallowing. For each subject and each cheese, the percentage of moistening ($\text{Moist}_{\%}$) into the bolus was calculated as follows:

$$\text{Moist}_{\%} = \left(\frac{B_{wc}}{B_{dm}} \times C_{dm} \right) - C_{wc}$$

B_{wc} represents the bolus water content (%), B_{dm} represents the bolus dry matter (%), C_{dm} represents the cheese dry matter (%) and C_{wc} represents the cheese water content (%).

Three replicates per cheese and per subject were performed.

Bolus rheology

Bolus rheological properties were measured as explained in more details in a previous paper [24]. Globally, the subjects were asked to chew the cheese samples until they were ready to swallow and to spit out the bolus into a truncated syringe. An aliquot of 3 mL of bolus at the syringe bottom was used for compression test to get a constant volume regardless of the cheese employed.

The compression device consisted of a mobile circle upper plate and a fixed circle lower plate. The test was performed with a compression rate of $1 \text{ mm} \cdot \text{s}^{-1}$. The fluid was subjected to a force F ranging between 0.01 N and 50 N. From the compression curve, particularly two phases were highlighted. A “flow phase” during which the suspension begins to flow and the particles move significantly in relation to one another at a height denoted as H_{flow} (mm). Yield stress and viscous effects were described respectively by the parameters S_{flow} (Pa) and K_{flow} (Pa.s). A “particle phase” during which the mechanical response is governed by the particles the size of which is represented by a height denoted H_{part} (mm) and the yield stress component denoted S_{part} (Pa). At the end of the compression, H_{end} (mm) denotes the

final height and S_{end} (mm^2) the area generated under the maximal force. All measurements were done in triplicate.

Mouth coating

Mouth coating ($\text{QRB}_{\%}$), defined as the residual food that sticks to the oral surface after food ingestion, was quantified by the “mouth rinse” method [26]. The lipids of the residual food were quantified by the intensity of curcumin fluorescence in the rinse water.

The quantity of curcumin (Naturex, France), used as a food colour (E100), was added during cheese production to reach a level of $30 \text{ mg} \cdot \text{kg}^{-1}$ in the final cheeses. To measure the amount of cheese remaining in the mouth, each subject was asked to place a piece of cheese (6 g, at 17°C) in the mouth and to chew normally until they needed to swallow. The subjects swallowed without cleaning movement and then rinsed their mouth (with cleaning movements) with 4 mL of warm water at 50°C for 30 s, and spat it into a vial. This rinsing procedure was applied two times consecutively and the spittle was cumulated in the same vials. The fluorescence intensity of curcumin was quantified using a Perkin Elmer 1420 Multilabel Counter Victor 3 V at an excitation wavelength of 450 nm and an emission wavelength of 510 nm. All measurements were done in triplicate.

Determination of maximal oral volume

An Eccovision acoustic pharyngometer (Hood Laboratories, USA) was used to measure the oral volume and was composed of four components: a wave tube, an electronic platform, a mouthpiece and a disposable filter. Reflectance pharyngometry was performed with a two-microphone imaging acoustic pharyngometer device, as described recently [28]. This device consists of two microphones and a horn model mounted on a wave tube and connected to a PC-compatible computer with signal conversion capabilities. The signal was converted into the surface change (cm^2) as a function of the length of the oral cavity (cm). The subjects held the mouthpiece in their mouth with their teeth against the flange and their tongue in a low position. To prevent air leaks, which could cause measurement errors, the subjects placed their lips over the flange, sealing the mouthpiece. The subjects were asked to breathe with their nose during the

measurement. Values are expressed in cm^3 and correspond to the average of 10 measures.

Collection of saliva samples and flux

The subjects were requested not to eat, drink or smoke starting from at least one hour before the collection of saliva samples.

Resting saliva was collected as previously described [28] by instructing the subjects to spit out the saliva every 30 seconds into a pre-weighed cup over a period of 5 minutes. For stimulated saliva, the subjects chewed a piece of Parafilm ($0.5 \text{ g} \pm 0.2 \text{ g}$) for a period of 1 min and spit out the saliva every 30 s. The cups were weighted and the salivary flow rates were expressed in $\text{mL} \cdot \text{min}^{-1}$.

Immediately after collection, the saliva samples were standardized by a first step of centrifugation for 30 min at $15000 \times g$ to remove bacteria and cellular debris and supernatants were then stored at -80°C to arrest metabolism until subjected to biochemical analyses [29].

Biochemical analyses of saliva samples

Protein concentration. Protein concentration (Prot expressed in $\text{mg} \cdot \text{mL}^{-1}$) was obtained by standard Bradford protein assay Quick Start (Bio-Rad, France) using bovine serum albumin (Sigma-Aldrich, France) as standard for calibration.

Enzyme activities. All enzyme activities were expressed in International Enzyme Activity Units (U) per ml of saliva. One U is defined as the amount of enzyme that catalyses the conversion of 1 micromole of substrate per minute.

The lipolytic (Lipolysis), proteolytic (Proteolysis), lysozymal (Lysozyme) and amylolytic (Amylase) activities were determined as previously described and are detailed below [10,30,31].

Lipolytic activity was determined as followed. The buffer contained 50 mM Tris-HCl, pH 7.5, 4 mM CaCl_2 , 2 mM EDTA (ethylenediaminetetraacetic acid), 0.2% (w/v) NaTDC (sodium taurodeoxycholate), 1 mM PMSF (phenylmethylsulfonyl fluoride), 1 mM DTT (dithiothreitol) and 0.02% (w/v) sodium azide. The substrate solution was prepared by vortexing 19 volumes of the above buffer for 10 s with 1 volume of an ethanolic solution of 4-methylumbelliferyl 7-oleate (Sigma-Aldrich, France) for a final concentration of 1 mM. Reaction was carried out in microplate. Reaction started by adding 37.5 μL of saliva to 150 μL of substrate solution and 1.5 μL ethanol. A reaction of inhibition was also conducted for each sample by adding 1.5 μL of 125 μM ethanolic solution of THL (tetrahydrolipstatin) instead of ethanol. The intensity of fluorescence was followed continuously during 30 min at 37°C (excitation filter 355 nm, emission filter 460 nm) using a microtiter plate fluorometer (Victor 3-V, Perkin Elmer, France). The lipolytic activity was calculated from the difference between the average activity of slopes obtained for each sample without and with the lipase inhibitor THL. Activity was then read against a standard curve of umbelliferone. At each set of measurements a control of the linearity and proportionality of the reaction was also performed with commercial lipase (*Aspergillus Niger* Lipase, Fluka, France).

Proteolytic activity was determined using a Pierce Fluorescent Assay Kit (Pierce Biotechnology, Rockford, IL). A fluorescein labelled casein substrate liberates fluorescein fragment during proteolytic digestion which was followed during 60 min at 37°C (excitation at 494 nm/emission at 518 nm).

Lysozymal activity was determined using an EnzCheck Lysozyme Assay Kit (Molecular Probes, The Netherlands). The kit is based on the measure of the lysozyme activity on substrate *Micrococcus lysodeikticus* labelled with fluorescein. Intensity of fluorescence, proportional to lysozyme activity is read against a

lysozyme standard and expressed in Unit/ml/min (excitation at 494 nm/emission at 518 nm).

Amylolytic activity was determined using CPNG3 Assay Kit (Biolabo, Maizy, France). The kit is based on the measure of the hydrolysis of 2-chloro-4-nitrophenyl malto trioside (CNPG3) into chloro-nitro-phenol (CNP), maltotriose and glucose. The rate of formation of CNP, directly proportional to the alpha-amylase activity, is measured at 405 nm against amylase standard.

Sodium and potassium analysis. The saliva samples were diluted to 1/20 (50 μL saliva in 950 μL filtered 18 m Ω Milli-Q-water (Millipore, Bedford, MA, USA)) and filtered through a membrane (pore size = 0.45 μm , C.I.L., Sainte-Foy-La-Grande, France).

The amounts of sodium (Na) and potassium (K) in saliva were determined by HPLC ionic chromatography using a Dionex ICS2500 ion chromatographic system (Dionex, Voisins le Bretonneux, France) as previously described [32] and expressed in mM. Quantifications were performed using calibration curves realised with sodium and potassium standard solutions ranging from 0.1 to 10 mM in 22 mM sulfuric acid ($R^2 = 0.999$).

Statistical analysis

Descriptive statistics on the four cheeses are reported in supplemental material and raw data are available on request.

Description and justification of the variables included into the MB-PLS analysis. The different variables used in the MB-PLS approach are presented in Table 3. They have been divided in six blocks. The Y block corresponds to the variables to be explained. It includes the most important variables related to aroma release measurement as explained above.

The five other blocks correspond to the explaining variables (X1–X5).

X1 is related to bolus rheological parameters. These parameters have been highlighted in a previous paper as being the most relevant to discriminate the subjects on the basis of their masticatory behaviour [24]. Globally, these parameters reflect the consistency and the structure of the bolus at different stages of compressions with a final force (50 N) corresponding to that applied during pressure of the tongue to the soft palate at the swallowing time [33].

X2 is related to oral volume (Oral_vol), moistening of the product (Moist_%) and the remaining amount of product in the oral cavity after swallowing (QRB_%). These measures refer to the mouth coating and the generation of product exchange surfaces on the oral cavity mucosa after swallowing.

X3 corresponds to chewing behaviour parameters extracted from the EMG signals. The main variables previously identified as discriminating the most different panellists in terms of masticatory behaviour against cheese matrices were the total muscle work (W_total), the chewing duration (Chew_time), the number of masticatory cycle (Nb_cycle) and the mean amplitude of the contraction (Ampl.) [24].

The two last blocks (X4–X5) correspond to resting (R) and stimulated (S) saliva characteristics and composition. Whole saliva has been described as playing an active role on bolus formation, taste and aroma release [34–37] [38]. The choice to focus on both types of saliva is backed up by the different roles of both fluids related to food oral processing and food sensory perception. Resting saliva composition has been identified as involved in the prevention of oral dryness, lubrication of the oral mucosa, emulsion destabilisation [37,39], fat perception [10,31,40] and bolus swallowing [41]. Stimulated saliva actively participates to the hydration of the bolus during chewing but also to the change of viscosity due to the action of some salivary enzymes such as

Table 3. Presentation of the different blocks of variables used in the MB-PLS analyses.

Block	Abbreviation	Definition of the variable
Y: aroma release parameters	A1	Area under the curve before 1 st swallowing
	A2	Area under the curve after 1 st swallowing
	A1/A2	Ratio between A1 and A2
	Imax1	Maximal intensity reached before 1 st swallowing
	Tmax1	Time to reach the maximal intensity before 1 st swallowing
	Imax1/Tmax1	Release rate before 1 st swallowing
	Imax2	Maximal intensity after 1 st swallowing
	Tmax2	Time of the maximal intensity after 1 st swallowing
	Imax2/Tmax2	Release rate after 1 st swallowing
X1: Bolus rheology	S _{flow}	Yield stress at flow phase of compression curve
	S _{part}	Yield stress at particle phase of compression curve
	H _{part}	Bolus height at the beginning of the particle phase of compression curve
	K _{flow}	Consistency at the flow phase, which reflects bolus consistency
	H _{flow}	Bolus height at the beginning of the flow phase of compression curve
	H _{end}	Bolus height at the end of compression
	S _{end}	Area at the end of compression
X2: Coating- oral volume-% moistening	QRB_%	Quantity of product remaining in the oral cavity after swallowing in %
	Moist_%	Moistening of the products just before the swallowing in %
	Oral_vol.	Volume of the oral cavity
X3: Electromyography	Nb_cycle	Number of chewing cycle
	Chew_time	Chewing duration
	Ampl.	Mean amplitude of contraction
	W_total	Energy expended in chewing
X4: Resting saliva composition	Sf_R	Salivary flow at rest
	Prot_R	Amount of salivary proteins at rest
	Lipolysis_R	Amount of Lipolysis in saliva at rest
	Amylase_R	Quantity of Amylase in saliva at rest
	Lysozyme_R	Amount of Lysozyme in saliva at rest
	Proteolysis_R	Amount of Proteolysis in saliva at rest
	Na_R	Amount of sodium in saliva at rest
	K_R	Amount of potassium in saliva at rest
X5: Stimulated saliva composition	Sf_S	Salivary flow stimulated saliva
	Prot_S	Amount of salivary proteins stimulated saliva
	Lipolysis_S	Amount of Lipolysis in stimulated saliva
	Amylase_S	Quantity of Amylase in stimulated saliva
	Lysozyme_S	Amount of Lysozyme in stimulated saliva
	Proteolysis_S	Amount of Proteolysis in stimulated saliva
	Na_S	Amount of sodium in stimulated saliva
	K_S	Amount of potassium in stimulated saliva

Y: variables to be explained; **X:** explanatory variables.

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alpha-amylase [42]. In term of salivary measured components, some refer more to the degradation of the product in the mouth (proteolysis, lipolysis, lysozyme and alpha-amylase), others to the interaction with aroma compounds (Na, K, proteins (Prot) and alpha-amylase) and still others to the oral moistening and clearance of the oral cavity (flow: Sf). A statistical test of comparison of means (Bonferroni-Dunn test; $\alpha = 0.05$) was performed to spotlight differences between resting and stimulated saliva. Only proteolysis variable (Prot) turned out to show no

significant difference between resting and stimulated saliva. Therefore, it was concluded that these two saliva samples were significantly different. Descriptive statistics of stimulated and resting saliva are reported in Table 2.

Statistical treatment. Statistical treatments of the present study were performed using the free software R 2.12.2 (Team 2011; <http://cran.r-project.org/>). The main R package used for multivariate data analyses was «pls 2.1-0» [43]. Statistical treatment consists to do an important pre-processing step as

Table 4. Percentage of inertia on the first three dimensions.

Ethyl propanoate		Dim1	Dim2	Dim3	Nonan-2-one		Dim1	Dim2	Dim3
lFS	Y	20.57	13.27	9.82	lFS	Y	27.05	13.41	7.97
	X	19.98	13.11	8.65		X	19.03	10.59	12.38
lFF	Y	24.10	19.12	8.98	lFF	Y	27.47	11.38	14.40
	X	15.85	10.88	13.78		X	16.20	14.77	9.35
hFS	Y	21.02	14.32	3.83	hFS	Y	24.66	14.06	5.91
	X	16.16	6.91	15.58		X	16.32	9.13	15.56
hFF	Y	16.66	12.13	6.03	hFF	Y	23.17	7.47	9.01
	X	19.38	8.58	10.48		X	20.00	13.11	6.33

lF: low fat, hF: high fat, S: soft, F: firm.
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described by Hassani *et al.*, [44]. It consists briefly to: at first all the variables (belonging to both X and Y) are mean centered; then variables in X and Y are scaled block-wise to balance the sum of square contribution for different blocks; finally, in order to explore the systematic variation patterns in X which are likely to predict the systematic variation patterns in Y, PLS algorithm is applied. Then, the relationships between X blocks and Y and the importance of each block X for explaining Y were calculated as described elsewhere [45].

Median values across triplicates were used for statistical treatments. Missing data were replaced by the median value of the corresponding group. We chose the median values instead of the average values in order to avoid the influence of outliers and other unsuitable data [10].

In order to avoid cumbersome graphical displays, it was required for the correlation loadings plot that the correlations between the variables to be displayed and the retained components should be larger than a threshold value ($R = 0.45$); the remaining variables were ignored.

Results

MB-PLS analyses were conducted on the different data sets to assess the extent to which the various blocks of variables explain the aroma release during cheese matrix consumption. The two aroma compounds nonan-2-one (NO) and ethyl propanoate (EP) were considered separately for statistical treatment.

Choice and importance of the dimensions in the projection

For the choice of the number of components to be retained, a leave one out cross-validation procedure was performed. In this procedure, each sample is in turn set aside and a (MB-PLS) model was set up on the basis of the remaining samples. Thereafter, this model was used to predict the responses for the sample that was held out. Eventually, a statistic that assesses the differences (sum of squared) between predicted and observed responses was computed. Its evolution according to the number of components introduced in the model is indicative of the appropriate number of components to be retained since this statistic either reaches a plateau or starts to increase as the number of components increases. This indicates that the additional components fail to improve the model or, even worse, impede its performance because of the so-called over fitting problem. More details about cross validation can be found elsewhere [46]. A less formal way of assessing the relevance of the components is to consider the

percentage of total variance in the Y block explained by the successive components. In our case study, the components beyond the third dimension explained less than 6%. Therefore, only the outputs of MB-PLS concerning the first three dimensions were explored. The block total variances (expressed as percentages) explained by MB-PLS components were used to assess the respective importance of the successive MP-PLS components. Two types of total variances were computed: those concerning the variables to be explained (Y block) and those concerning the explanatory variables (X blocks). The total variance of block Y was chosen to prioritize the importance of the three components (Table 4). In all the cases, the first MB-PLS component explains a larger variation than the two subsequent components. For ethyl propanoate (EP), the second component is more important than the third whereas for nonan-2-one (NO), the importance of dimensions 2 and 3 is more balanced. The firm cheeses have a larger explained variance on dimension 3 whereas soft cheeses have a larger explained variance on dimension 2. Moreover the total cumulated variance for the three dimensions is comprised between 34.82% and 53.25%. Considering the high variability and the importance of the error measurements in the data, this was believed to be large enough to draw tangible conclusions.

Relative Importance of the blocks in the projection

The importance of the blocks of variables for each MB-PLS dimension is shown in figures 2 and 3. For both molecules and whatever the cheese EMG block is always the most important block with an average percentage of variance explained comprised between 50% and 70% for the first dimension. For ethyl propanoate (EP) and whatever the cheese, stimulated saliva block is mainly reflected by the second dimension whereas rheology and coating-oral volume-moistening blocks are mainly reflected by the third dimension. For nonan-2-one (NO), the importance of the blocks on dimensions 2 and 3 is slightly different and depends on the cheese. For lFF cheese, rheology is mainly reflected by the second dimension whereas for hFF cheese it is the coating-oral volume-moistening block which loads on this dimension. The third dimension is mainly explained by the rheology block for lFS cheese and by the block of stimulated saliva for hFF cheese. For lFF and hFS cheeses the coating-oral volume-moistening block is almost as important as the rheology block.

Finally saliva at rest poorly contributes to the analysis when compared to stimulated saliva.

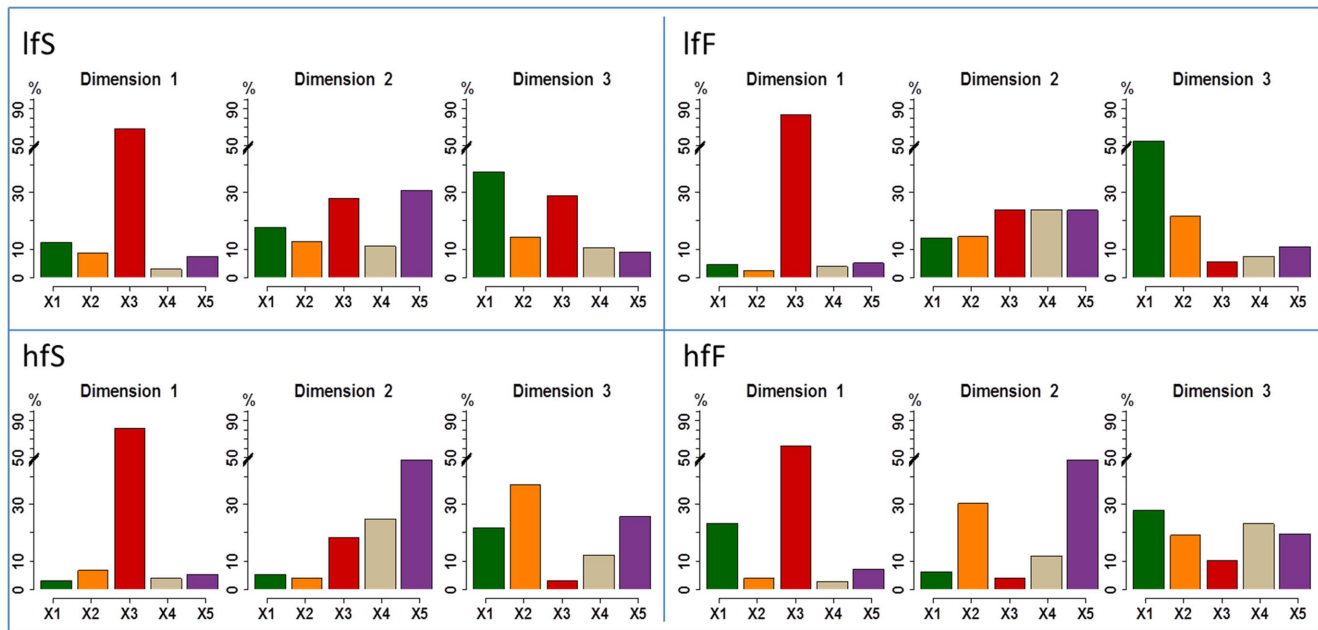


Figure 2. Bar charts representing the importance of the different blocks of variables (X1–X5) for the different dimensions obtained by means of MB-PLS analysis performed on ethyl propanoate release data set and for the four cheeses products. Green chart: rheology, Orange chart: coating, oral volume and % moistening, Red chart: EMG data, Grey chart: resting saliva composition, Violet chart: stimulated saliva composition.

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Projections of the different variables

The projections of the different variables from each block are presented in figures 4, 5, 6 and 7. On these figures, all the Y-variables are shown whereas, as stated above, only the explanatory

variables with a correlation coefficient with one or the other of the components above 0.45 are depicted.

Electromyography block. Variables of electromyography block are depicted in red in the projection. For each projection, three explanatory variables (Nb_cycle, Chew_time and W_total)

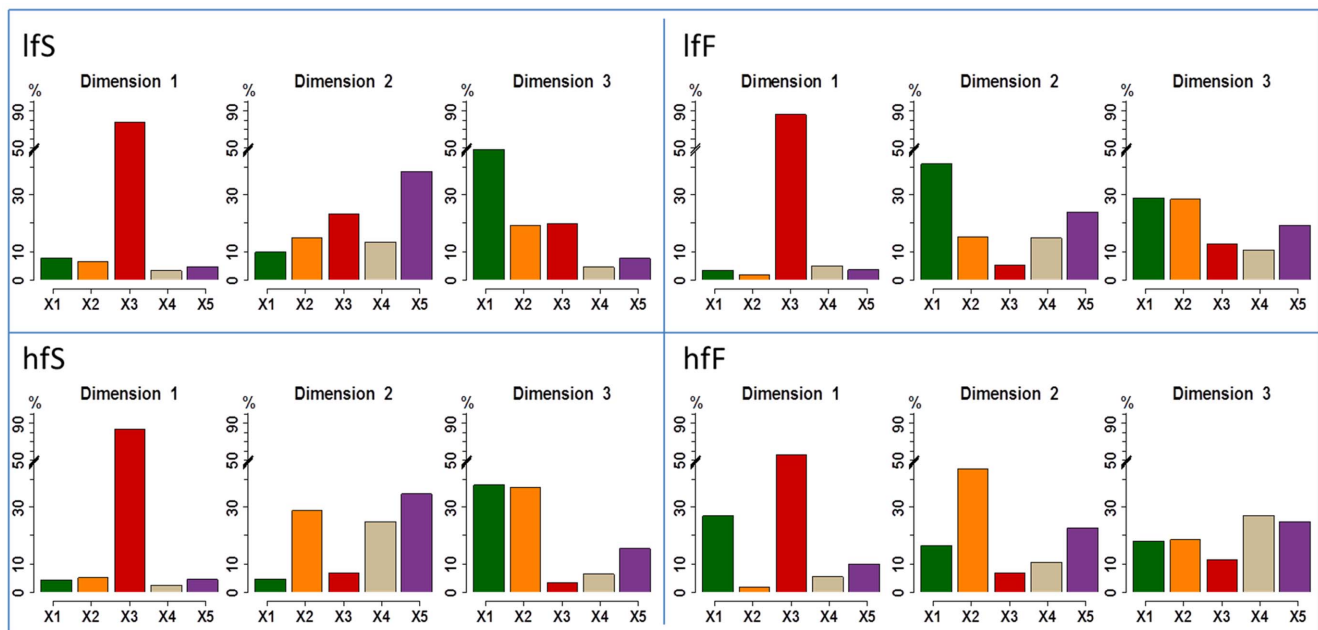


Figure 3. Bar charts representing the importance of the different blocks of variables (X1–X5) for the different dimensions obtained by means of MB-PLS analysis performed on nonan-2-one release data set and for the 4 cheeses products. Green chart: rheology, Orange chart: coating, oral volume and % moistening, Red chart: EMG data, Grey chart: resting saliva composition, Violet chart: stimulated saliva composition.

doi:10.1371/journal.pone.0093113.g003

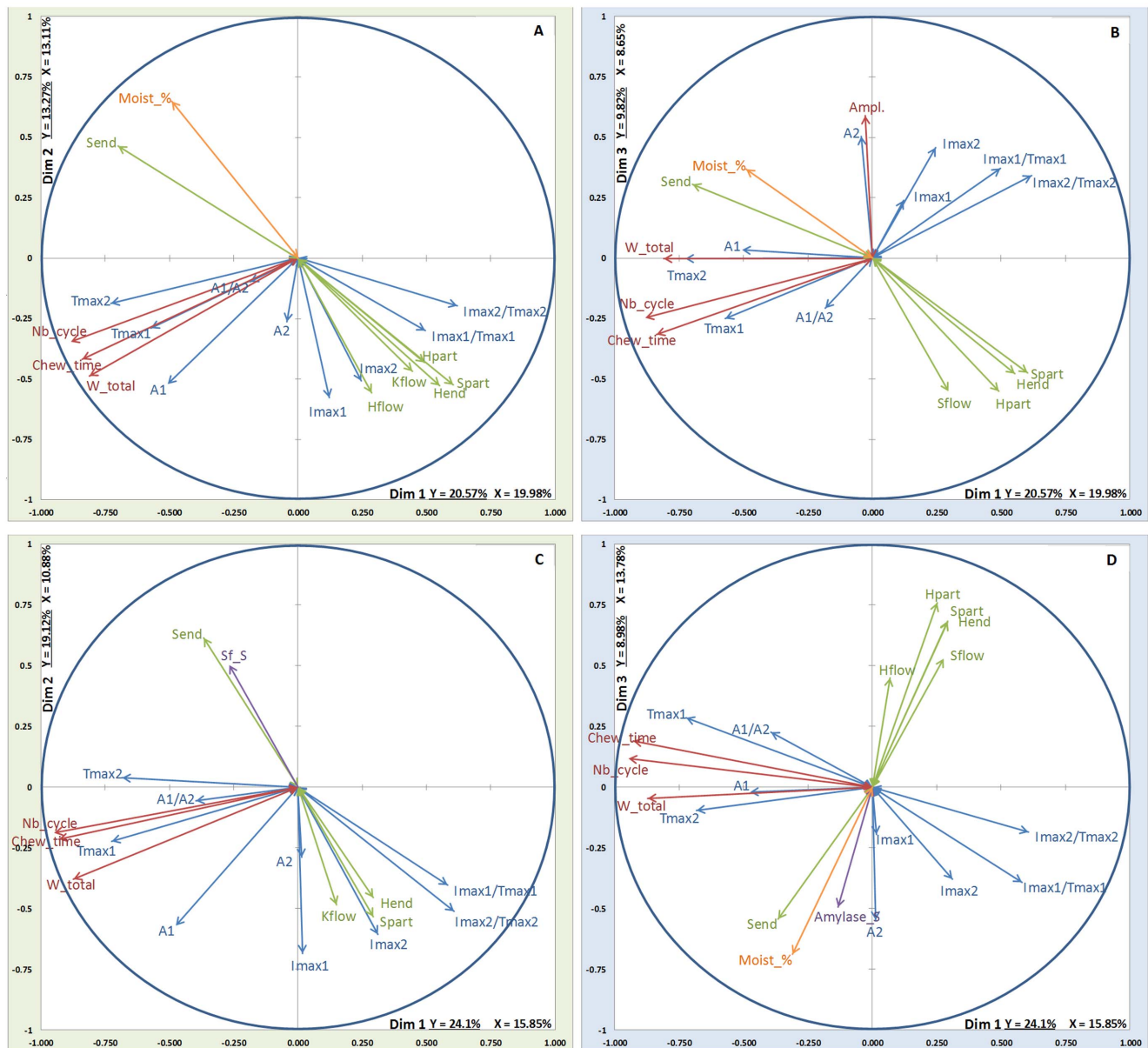


Figure 4. MB-PLS results on dim1/dim2 and dim1/dim3: relationships between the X-blocks of explanatory variables (Green arrows: rheology, Orange arrows: coating, oral volume and % moistening, Red arrows: EMG data, Violet arrows: stimulated saliva composition) and the Y-block of variables to be explained (% amplitude, % volume, % moistening, % saliva composition) for ethyl propanoate and low fat cheeses. Top: soft cheese; Bottom: firm cheese. A: EP_lfs (dim 1/dim2); B: EP_lfs (dim 1/dim3); C: EP_lff (dim 1/dim2); D: EP_lff (dim 1/dim3). doi:10.1371/journal.pone.0093113.g004

constituting the electromyography block are shown on the correlation plot, thus confirming the importance of this block. For aroma release variables (depicted in blue), Tmax1 and A1 are correlated with Nb_cycle variables Chew_time and W_total. The fourth variable (Ampl.) appears only in the EP_lfs (Fig. 4B), EP_hfS (Fig. 5A) and NO_lfs (Fig. 6B) projections and is not correlated with the three other variables. Aroma release variables Imax2 and Tmax2 seem to be better correlated with the variable Ampl.

Rheology block. Variables of rheology block are depicted in green in the projection. All the variables constituting the Rheology block seem to point to the same direction (indicating a positive correlation), except the variable S_{end} that points to the opposite direction than the other variables. The variables of this block

(S_{flow}, H_{flow}, K_{flow}, H_{part}, H_{end}, S_{part}) are correlated with the following aroma release variables: Imax1, Imax2, Imax1/Tmax1 and Imax2/Tmax2. This correlation is noticed for both molecules and especially for low fat cheeses (lff & lfs) (Fig. 4 & 5).

Coating, oral volume and percentage of moistening block. This block is depicted in orange in the projection. For this block and nonan-2-one (NO), it can be noticed that QRB_% correlates on dimension 2 with the aroma release variables Imax2 and A2 for NO_hfS (Fig. 7A). Moreover, it is observed that the Moist_% variable is highly correlated with S_{end} (from the rheology block) whatever the projection, when they are depicted together.

Stimulated saliva block. For stimulated saliva block depicted in violet in the projection, the most frequently depicted variable is the salivary flow (Sf_S) and alpha-amylase (Amylase_S), except

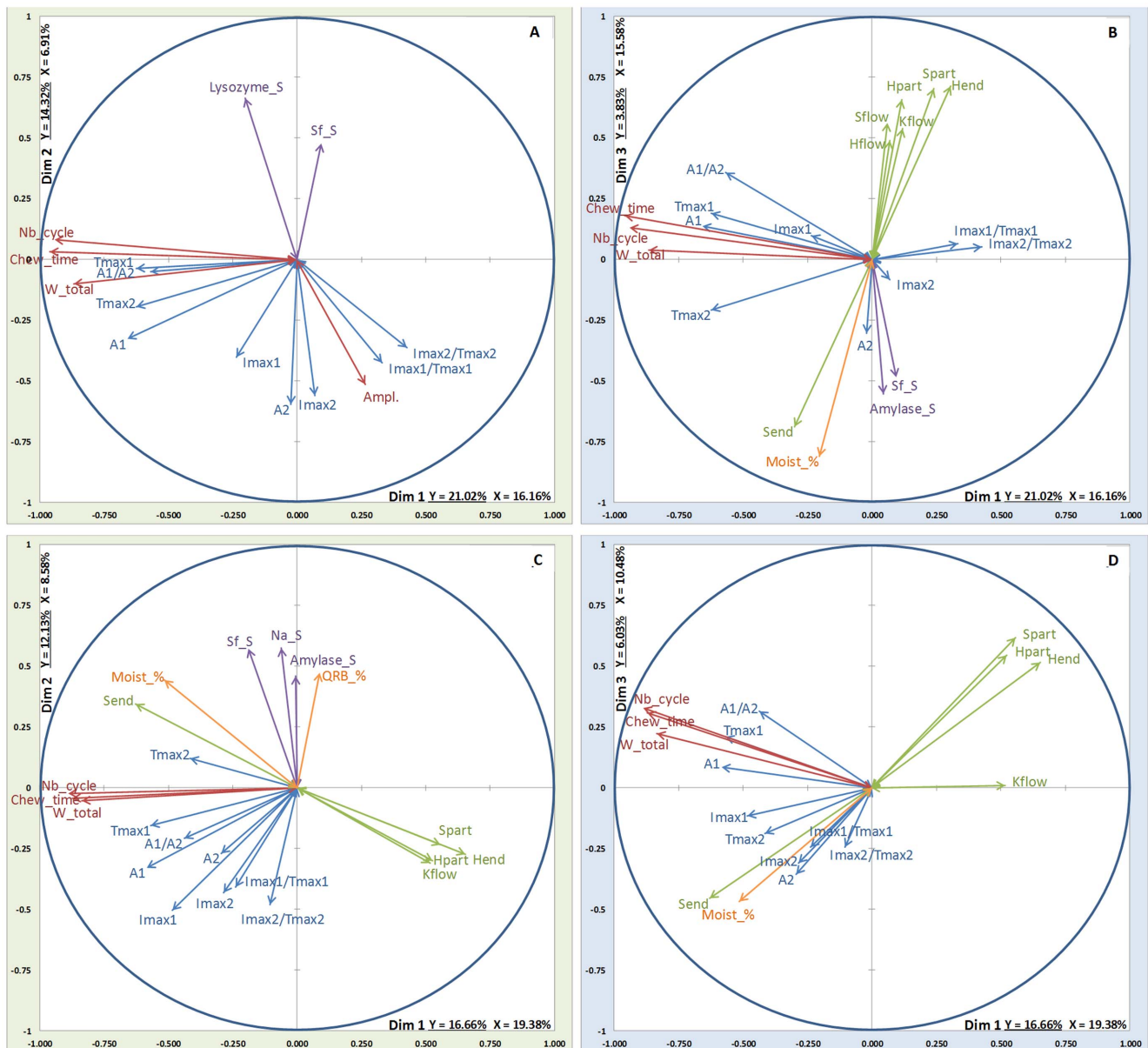


Figure 5. MB-PLS results on dim1/dim2 and dim1/dim3: relationships between the X-blocks of explanatory variables (Green arrows: rheology, Orange arrows: coating, oral volume and % moistening, Red arrows: EMG data, Violet arrows: high fat saliva composition) and the Y-blocks of variables to be explained (Blue arrows: aroma release) for ethyl propanoate and stigmastanol. Top: soft cheese; Bottom: firm cheese. A: EP_hfS (dim 1/dim2); B: EP_hfS (dim 1/dim3); C: EP_hfF (dim 1/dim2); D: EP_hfF (dim 1/dim3). doi:10.1371/journal.pone.0093113.g005

for EP_hfS (Fig. 4A&B) where the block is not depicted. Generally, these variables from saliva block are projected along the dimensions 2 or 3 and are more correlated with the percentage of moistening (Moist_%) and S_{end} . This implies that the saliva block variables tend to be negatively correlated with the variables pertaining to aroma release. This is especially highlighted for EP_hfF (Fig. 4C), EP_hfS and EP_hfF (Fig. 5A, B & C) and NO_hfS (Fig. 7A).

Discussion

The MB-PLS approach allowed us to relate the oral parameters to aroma release in a global statistical analysis. The objective of the present study was to test whether oral physiological characteristics,

bolus rheology, saliva composition and mouth coating could explain the variability in aroma release observed in a significant number of human subjects. The statistical analysis prioritized the different blocks and highlighted the most relevant variables inside each block. This approach is likely to help setting up mechanistic hypotheses on aroma release.

Masticatory behaviour

Among the four variables included in the masticatory behaviour block, three of them, namely, total work (W_{total}), chewing duration (Chew_time) and number of cycles (Nb_cycle) mainly explained the area under the curve during the chewing phase (A1) and the time to reach maximum intensity during this phase (Tmax1), whatever cheese and aroma compound. A lot of data in

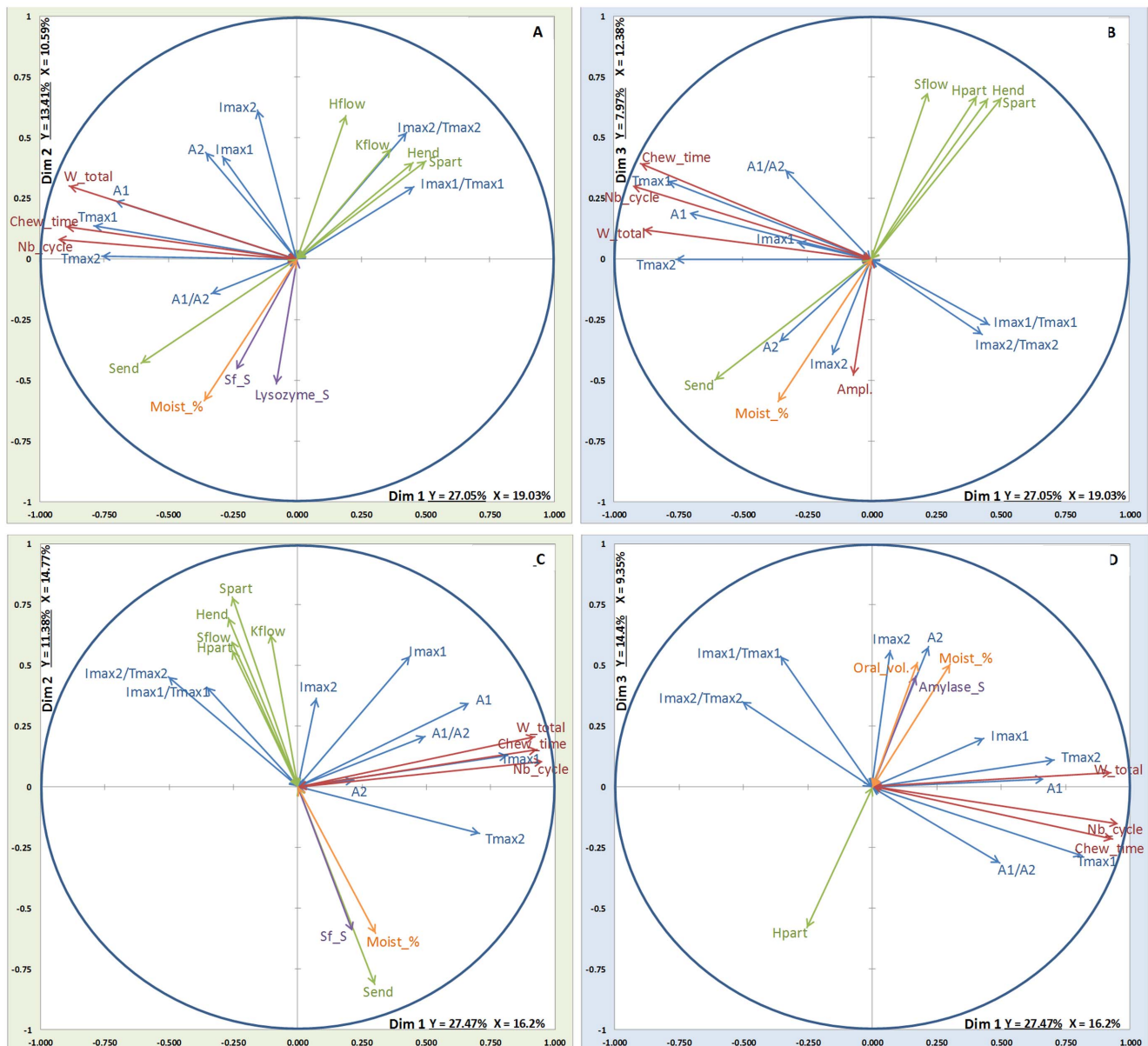


Figure 6. MB-PLS results on dim1/dim2 and dim1/dim3: relationships between the X-blocks of explanatory variables (Green arrows: rheology, Orange arrows: coating, oral volume and % moisture, Red arrows: EMG data, Violet arrows: stimulated saliva composition) and the Y-block of variables to be explained (Blue arrows: variables for nonan-2-one and low fat cheeses. Top: soft cheese; Bottom: firm cheese. A: NO_lfs (dim 1/dim2); B: NO_lfs (dim 1/dim3); C: NO_lfs (dim 1/dim2); D: NO_lfs (dim 1/dim3).
doi:10.1371/journal.pone.0093113.g006

the literature are available evidencing that the number of chews, chewing work [47,48], chewing frequency [49], longer chewing time and higher bursts number [50,51] are positively correlated with high concentration of volatiles in the nose. The duration of mastication was found one of the parameters which had a major influence on the release dynamics obtained with a mechanistic model [8].

However our data highlighted that the average amplitude (Ampl.) was not correlated with other masticatory parameters. This parameter, when depicted on the projection, explained aroma release after swallowing for low fat cheeses and to a lower extend the rate of release. This was not evidenced in the literature yet. This finding could be explained by the fact that these types of cheeses are relatively firm (BS higher than 15000 Pa) and thus

need a higher chewing force than high fat cheeses [50,51]. This higher amplitude per burst might induce a quick release of aroma compounds, which explains the correlation with the rates of release. Moreover different chewing behaviours were already observed when eating confectionery chews [50,51] and subjects displaying a higher chewing force («energetic» eaters) presented a shorter chewing time which was responsible for a lower amount of aroma released in the nasal cavity. This was explained by a too short time to accumulate volatile in the oral headspace. In our study, the large average amplitude could also be associated to a higher bolus breakdown leading to higher bolus spreadability (S_{end}) and lower particle size (H_{part}), as shown on the projections EP_lfs (Fig. 4B) and NO_lfs (Fig. 6B), which explains the higher amount of aroma release during the post swallowing phase. It was

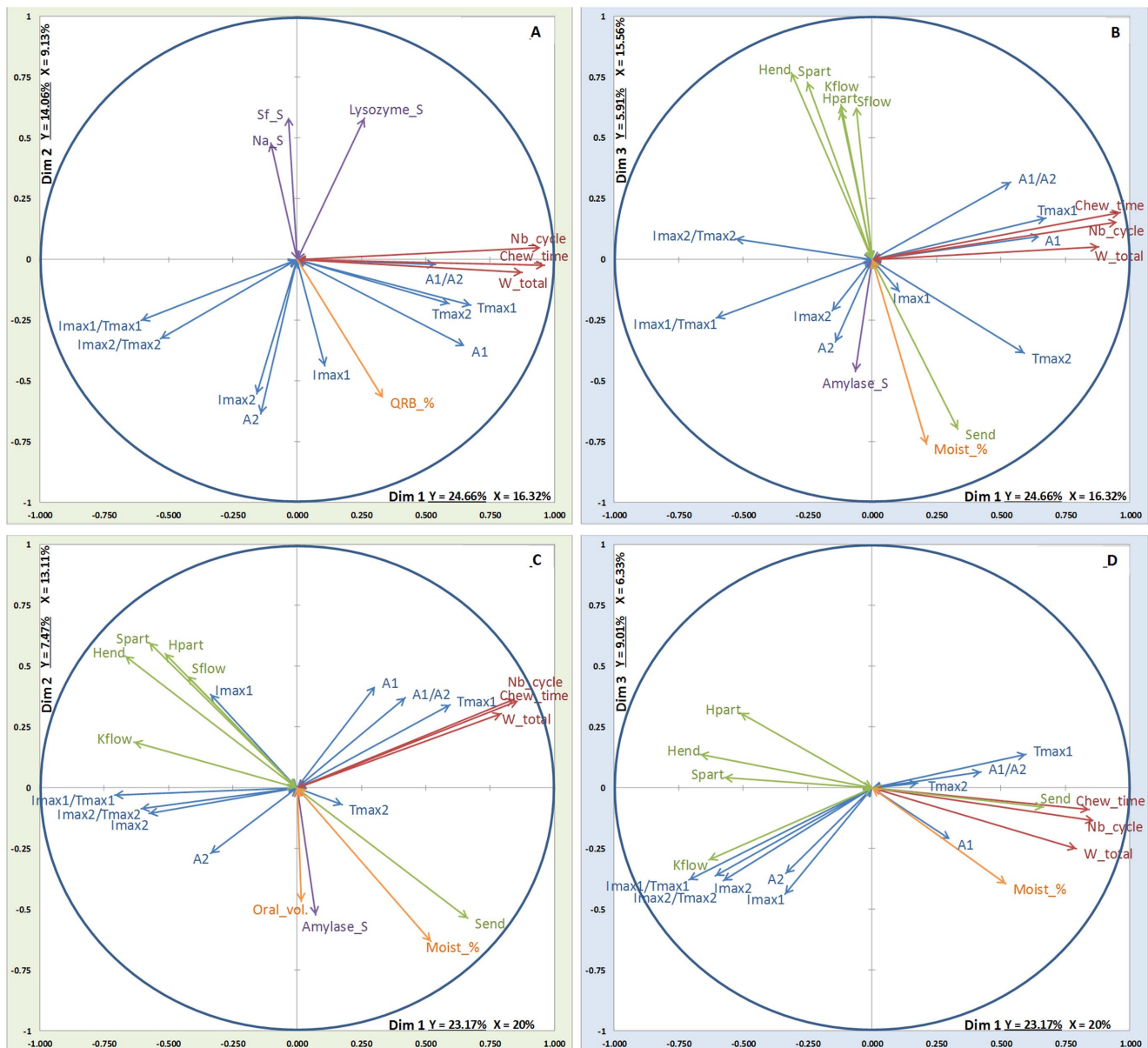


Figure 7. MB-PLS results on dim1/dim2 and dim1/dim3: relationships between the X-blocks of explanatory variables (Green arrows: rheology, Orange arrows: coating, oral volume and % moistening, Red arrows: EMG data, Violet arrows: stimulated saliva composition) and the Y-block of variables to be explained (Blue arrows: aroma nonan-2-one and high fat cheeses). Top: soft cheese; Bottom: firm cheese. A: NO_hfs (dim 1/dim2); B: NO_hfs (dim 1/dim3); C: NO_hff (dim 1/dim2); D: NO_hff (dim 1/dim3).
doi:10.1371/journal.pone.0093113.g007

also previously reported [24] that subjects who adapted their chewing behaviour to the product present a higher average amplitude (Ampl.) associated to a higher bolus spreadability (S_{end}).

Bolus rheology

Among the seven parameters included in the bolus rheology block, six characterized the bolus structure *i.e.*, representing bolus height (H_{part} , h_{flow} , H_{end}), bolus consistency (K_{flow}) and viscosity (S_{flow} , S_{part}). These parameters are highly correlated with food texture properties whatever the food [52,53]. In our study, these six parameters are highly correlated with each other and mainly explain the release rate ($Imax/tmax$) and maximum intensity ($Imax$) of both aroma compounds from the firmer cheeses. These aroma compounds are released faster when the bolus is more

consistent. The last variable, S_{end} , is projected on the opposite side of the other variables. It represents the bolus area at the end of bolus compression, which is the bolus spreadability at the swallowing time, which is greater when bolus is less structured. S_{end} better explains the time to reach maximum intensity during the post swallowing phase ($Tmax2$) for the two aroma compounds and also the area under the curve during the post swallowing phase for nonan-2-one (NO), the most hydrophobic compound. This can be clearly explained by the higher affinity of nonan-2-one (NO) for fat, this compound being less released during the chewing phase [9], and thus more released during the post-swallowing phase, specifically in the case where a large quantity of the product remains in the mouth due to a higher bolus spreadability (S_{end}). The higher release of this hydrophobic compound in relation with

a higher bolus spreadability can be explained by a higher exchange area between food bolus and air, allowing more mass transfer to occur, which could induce a higher persistence of aroma in the breath [4].

Bolus moistening and mouth coating

Bolus moistening (Moist_%) is depicted on the different plots suggesting an influence of this parameter on aroma release as mentioned also by Doyennette *et al.* [8]. A higher moistening induced a greater bolus spreadability (S_{end}). These parameters being negatively correlated with the release rates (I_{max}/T_{max}) and maximum intensities (I_{max}) of both aroma compounds from the low fat cheeses (lFS and lF) and to some extent in relation with the higher amount of nonan-2-one (NO) released during the post swallowing phase (A2). Results obtained on the effect of bolus moistening cannot be simply explained by the Buttery equation [54]. Using this model, Doyennette *et al.* [55] were able to predict the changes in air/bolus partition coefficients for ethyl propanoate (EP) by incorporating increasing amounts of artificial saliva into model cheeses. They found a significant increase in EP air/bolus partition coefficient by increasing bolus moistening, whereas our results showed no effect of bolus moistening on area under the curve. Moreover, the same authors noticed a parabolic shape evolution of mass transfer coefficients by addition of saliva in the bolus issued from firm cheeses, with a minimum for the 50% dilution and a continuous increase for soft cheeses. Our results could not be explained by these predicted values, because the effect of bolus moistening on aroma release appears mainly dependent on the fat content and not on the firmness. Other factors than just dilution may explain *in vivo* aroma release. As a matter of fact, there should be a combined effect of saliva dilution and bolus spreadability on *in vivo* aroma release because these two parameters are always closely related. Using a mouth simulator Otake *et al.* [56] showed that dilution by saliva decreased the concentration of hydrophilic aroma compounds in the vapour phase. For more viscous samples such as dressings, which stick onto the inside cell wall, a higher aroma release was observed in comparison with simple emulsions, due to an increase in surface area.

Mouth coating (QRB_%) mainly explained the release of the more hydrophobic compound, nonan-2-one (NO) after swallowing for the high fat and soft cheese (hFS), the higher the coating, the higher the amount of this compound released after swallowing (A2), which can logically be explained by the fact that this hydrophobic compound is more soluble in fat than in water and thus is less released during the chewing phase from high fat cheeses. A higher amount of product remaining in the mouth will allow this compound to be released during a longer period of time (higher T_{max2}) and thus lead to a higher total amount of aroma released (A2).

Saliva flow and composition

Between the two saliva blocks, aroma release was only explained by stimulated saliva. Indeed, resting saliva is principally involved in the initial tasting of foods [57]. On food bolus structure, it has been described as being involved in destabilization and mouthfeel of liquid emulsions [37,58,59] [60] which does not involve a chewing behaviour. Stimulated saliva is particularly requested in bolus formation and structure during chewing of harder foods such as cheeses. Its incorporation into the bolus is essential for the coating of food particles to form a swallowable bolus [61]. Stimulated saliva block was projected essentially onto the second dimension for both soft and firm cheeses whatever the aroma compound and fat content. Salivary flow (Sf_S), alpha-amylase

(Amylase_S), lysozyme (Lysozyme_S) and sodium (Na_S) were the most significant variables into the projection. In particular salivary flow (Sf_S) and the release rate (I_{max}/T_{max}) and amount of aroma release (A1 & A2) are negatively correlated along dimension 2. In a time-intensity study conducted on 17 subjects, Guinard *et al.* [62], showed that the rate of release of flavour from cheery flavoured chewing gum can decrease when stimulated salivary flow increased. This effect was also noticed on *in vitro* studies conducted on beans, which showed a decrease of aroma release when volume of artificial saliva increased probably due to a dilution effect [63]. Moreover, stimulated saliva participates to oral clearance of remaining food [57], a higher flow leading to a higher removal of food debris in the oral cavity and thus to less aroma release. For other salivary variables, the effects are less significant. Lysozyme (Lysozyme_S) is only significant for soft cheese and is always depicted in the same direction as salivary flow (Sf_S) suggesting a similar role. The role of salivary lysozyme on food oral processing is not known for hard matrices. However, due to its positive charge, its effect in the structure of emulsion has been recently suggested [10]. For alpha-amylase (Amylase_S) and sodium content (Na_S), the effects are less significant and seem to vary depending on the cheeses and aroma compounds. These two parameters are projected in the same direction than the flow for ethyl propanoate (EP) and hF (Fig. 5C) and for nonan-2-one (NO) and hFS (Fig. 7A), and in both cases in the opposite direction to the area under the curve after swallowing on the second dimension. These results confirm previous observations conducted in a mouth simulator which showed that the retention effect of salivary proteins (alpha-amylase and/or mucin) was higher than an eventual salting out effect of the salts [64].

Conclusion

This study highlights the influence of some parameters which were not identified in previous ones.

Among the masticatory parameters which explain most of the differences in aroma release, the specific influence of mean amplitude on aroma release after swallowing was highlighted. This parameter was not evidenced in previous studies relating masticatory behaviour with aroma release.

Bolus rheology has a lower influence but it was noticed that the bolus spreadability explained the persistence of hydrophobic compounds in the breath, in close relation with bolus moistening. This aroma persistence was the subject of several studies involving biomechanical models. For example, the mechanistic model developed by Trelea *et al.* [6] explained the increased aroma persistence in the breath by an increase in the residual product layer thickness. However this model could not be validated by real data on residual product in the pharynx. This parameter was further introduced in a simplified biomechanical model to simulate the relative concentration of two aroma compounds in the nose of subjects consuming flavoured glucose syrups [7]. Even if the assumption stipulating that the post-deglutitive pharyngeal residue diluted by saliva highly influences aroma release seems relevant, the bolus spreadability, which could be easily measured, should be taken into account in order to validate the model by experimental data. Finally, our work highlights the sole contribution of stimulated saliva on aroma release compared to resting saliva. This contribution is not only linked to a moistening of the matrix by water but also to other salivary components. However, one must bear in mind that saliva standardization procedure (centrifugation and congelation) as done in the current study may also affect some protein and/or enzyme levels and activities compared to whole saliva [29]. It is thus likely that such stimulated

salivary components may contribute to aroma release from the food bolus differently in whole saliva. Moreover other salivary components not measured in the current study should be involved, as for instance, protein which is rich in prolin (PRP) that constitutes up to 75% of the proteins in stimulated saliva [65,66].

MB-PLS approach made it possible to evidence the combined effect of bolus moistening and bolus consistency to explain the decreased rates of release of aroma compounds by saliva incorporation and the role of some saliva components. These results could not be explained by *in vitro* experiments and predictive models for aroma transfer. Our approach brings complementary results to those obtained using a mechanistic model with the same experimental data on the same cheeses [8]. This model fitted with 10 selected subjects and was successful only on one aroma compound, ethyl propanoate suggesting that the more hydrophobic aroma compound, nonan-2-one could be retained by lubricated mucosa. Moreover our statistical and integrated approach allowed the comparison of the effects observed for the two aroma compounds and a selection of the most important parameters to explain aroma release. Therefore,

References

- de Roos KB, Wolswinkel K (1994) Non-equilibrium partition model for predicting flavour release in the mouth. In: Maarse H, van der Heij DG, editors. Trends in Flavour Research: Elsevier Science. pp. 15–32.
- Normand V, Avison S, Parker A (2004) Modeling the kinetics of flavour release during drinking. Chemical Senses 29: 235–245.
- Harrison M, Campbell S, Hills B (1998) Computer simulation of flavor release from solid foods in the mouth. Journal of Agricultural and Food Chemistry 46: 2736–2743.
- Wright KM, Hills BP, Hollowood TA, Linforth RST, Taylor AJ (2003) Persistence effects in flavour release from liquids in the mouth. International Journal of Food Science and Technology 38: 343–350.
- Wright KM, Hills BP (2003) Modelling flavour release from a chewed bolus in the mouth: Part II. The release kinetics. International Journal of Food Science and Technology 38: 361–368.
- Trelea IC, Atlan S, Deleris I, Saint-Eve A, Marin M, et al. (2008) Mechanistic mathematical model for *in vivo* aroma release during eating of semiliquid foods. Chemical Senses 33: 181–192.
- Doyennette M, de Loubens C, Deleris I, Souchon I, Trelea IC (2011) Mechanisms explaining the role of viscosity and post-deglutitive pharyngeal residue on *in vivo* aroma release: A combined experimental and modeling study. Food Chemistry 128: 380–390.
- Doyennette M, Deleris I, Feron G, Guichard E, Souchon I, et al. (2014) Main individual and product characteristics influencing in-mouth flavour release during eating masticated food products with different textures: Mechanistic modelling and experimental validation. Journal of theoretical biology 340: 209–221.
- Repoux M, Laboure H, Courcoux P, Andriot I, Semon E, et al. (2012) Combined effect of cheese characteristics and food oral processing on *in vivo* aroma release. Flavour and Fragrance Journal 27: 414–423.
- Poette J, Mekoué J, Neyraud E, Berdeaux O, Renault A, et al. (2014) Fat sensitivity in humans: oleic acid detection threshold is linked to saliva composition and oral volume. Flavour and Fragrance Journal 29: 39–49.
- Bras LP, Bernardino SA, Lopes JA, Menezes JC (2005) Multiblock PLS as an approach to compare and combine NIR and MIR spectra in calibrations of soybean flour. Chemometrics and Intelligent Laboratory Systems 75: 91–99.
- Choi SW, Lee I-B (2005) Multiblock PLS-based localized process diagnosis. Journal of Process Control 15: 295–306.
- Gerlach RW, Kowalski BR, Wold HOA (1979) Partial least-squares path modelling with latent variables. Analytica Chimica Acta 112: 417–421.
- Kohonen J, Reinikainen S-P, Aaljoki K, Perkio A, Vaananen T, et al. (2008) Multi-block methods in multivariate process control. Journal of Chemometrics 22: 281–287.
- Kohonen J, Reinikainen S-P, Hoskuldsson A (2009) Block-based approach to modelling of granulated fertilizers' quality. Chemometrics and Intelligent Laboratory Systems 97: 18–24.
- Naes T, Martens H (1985) Comparison of prediction methods for multicollinear data. Communications in Statistics-Simulation and Computation 14: 545–576.
- Reinikainen S-P, Hoskuldsson A (2007) Multivariate statistical analysis of a multi-step industrial processes. Analytica Chimica Acta 595: 248–256.
- Westerhuis JA, Kourti T, MacGregor JF (1998) Analysis of multiblock and hierarchical PCA and PLS models. Journal of Chemometrics 12: 301–321.
- Wold S, Albano C, Dunn WJ, Esbensen K, Hellberg S, et al. (1984) Modeling data tables by principal components and pls - class patterns and quantitative predictive relations. Analysis 12: 477–485.
- Moyon T, Le Marec F, Qannari E, Vigneau E, Le Plain A, et al. (2012) Statistical strategies for relating metabolomics and proteomics data: a real case study in nutrition research area. Metabolomics 8: 1090–1101.
- Piombino P, Sinesio F, Moneta E, Cammareri M, Genovese A, et al. (2013) Investigating physicochemical, volatile and sensory parameters playing a positive or a negative role on tomato liking. Food Research International 50: 409–419.
- Aquilanti L, Santarelli S, Babini V, Osimani A, Clementi F (2013) Quality evaluation and discrimination of semi-hard and hard cheeses from the Marche region (Central Italy) using chemometric tools. International Dairy Journal 29: 42–52.
- Cappellin L, Aprea E, Granitto P, Wehrens R, Soukoulis C, et al. (2012) Linking GC-MS and PTR-TOF-MS fingerprints of food samples. Chemometrics and Intelligent Laboratory Systems 118: 301–307.
- Yven C, Patarin J, Magnin A, Labouré H, Repoux M, et al. (2012) Consequences of individual chewing strategies on bolus rheological properties at the swallowing threshold. Journal of Texture Studies 43: 309–318.
- Repoux M, Sémon E, Feron G, Guichard E, Labouré H (2012) Inter-individual variability in aroma release during sweet mint consumption. Flavour and Fragrance Journal 27: 40–46.
- Repoux M, Septier C, Palicki O, Guichard E, Feron G, et al. (2012) Solid cheese consumption: Quantification of oral coating. Archives of Oral Biology 57: 81–86.
- Mioche L, Bourdiol P, Monier S (2003) Chewing behaviour and bolus formation during mastication of meat with different textures. Archives of Oral Biology 48: 193–200.
- Mishellany-Dutour A, Woda A, Laboure H, Bourdiol P, Lachaze P, et al. (2012) Retro-Nasal Aroma Release Is Correlated with Variations in the In-Mouth Air Cavity Volume after Empty Deglutition. Plos One 7: 8.
- Schipper RG, Silletti E, Vingerhoeds MH (2007) Saliva as research material: Biochemical, physicochemical and practical aspects. Archives of Oral Biology 52: 1114–1135.
- Drago SR, Panouille M, Saint-Eve A, Neyraud E, Feron G, et al. (2011) Relationships between saliva and food bolus properties from model dairy products. Food Hydrocolloids 25: 659–667.
- Neyraud E, Palicki O, Schwartz C, Nicklaus S, Feron G (2012) Variability of human saliva composition: Possible relationships with fat perception and liking. Archives of Oral Biology 57: 556–566.
- Emorine M, Septier C, Thomas-Danguin T, Salles C (2013) Heterogeneous salt distribution in hot snacks enhances saltiness without loss of acceptability. Food Research International 51: 641–647.
- Ono T, Hori K, Nokubi T (2004) Pattern of Tongue Pressure on Hard Palate During Swallowing. Dysphagia 19: 259–264.
- de Roos KB (2003) Effect of texture and microstructure on flavour retention and release. International Dairy Journal 13: 593–605.
- Hussein MM, Kachikian R, Pidel AR (1983) Analysis for Flavor Residuals in the Mouth by Gas Chromatography. Journal of Food Science 48: 884–885.
- Malone ME, Appelqvist IAM, Norton IT (2003) Oral behaviour of food hydrocolloids and emulsions. Part 2. Taste and aroma release. Food Hydrocolloids 17: 775–784.
- Silletti E, Vingerhoeds MH, Van Aken GA, Norde W (2008) Rheological behavior of food emulsions mixed with saliva: Effect of oil content, salivary protein content, and saliva type. Food Biophysics 3: 318–328.
- Genovese A, Piombino P, Gambuti A, Moio L (2009) Simulation of retronasal aroma of white and red wine in a model mouth system. Investigating the

MB-PLS appears to be a powerful statistical approach in food science and aroma release in order to prioritize and identify novel important variables that should be taken into account in future scientific studies in the field.

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Author Contributions

Conceived and designed the experiments: GF HL EG. Performed the experiments: GF HL EG. Analyzed the data: GF CA EMQ PC. Contributed reagents/materials/analysis tools: GF HL EMQ EG. Wrote the paper: GF CA EMQ EG.

- influence of saliva on volatile compound concentrations. *Food Chemistry* 114: 100–107.
39. Silletti E, Vingerhoeds MH, Norde W, van Aken GA (2007) Complex formation in mixtures of lysozyme-stabilized emulsions and human saliva. *Journal of Colloid and Interface Science* 313: 485–493.
 40. Mounayar R, Septier C, Chabanet C, Feron G, Neyraud E (2013) Oral Fat Sensitivity in Humans: Links to Saliva Composition Before and After Stimulation by Oleic Acid. *Chemosensory Perception*: 1–9.
 41. Vanderreijden WA, Veerman ECI, Amerongen AVN (1993) Shear rate-dependent viscoelastic behavior of human glandular salivas. *Biorheology* 30: 141–152.
 42. de Wijk RA, Prinz JF, Engelen L, Weenen H (2004) The role of [alpha]-amylase in the perception of oral texture and flavour in custards. *Physiology & Behavior. Special Section on Olfactory Perception, Communication, and the Nose-to-Brain Pathway* 83: 81–91.
 43. Mevik BH, Wehrens R (2007) The pls package: Principal component and partial least squares regression in R. *Journal of Statistical Software* 18.
 44. Hassani S, Martens H, Qannari EL, Hanafi M, Kohler A (2012) Model validation and error estimation in multi-block partial least squares regression. *Chemometrics and intelligent laboratory systems* 117: 42–53.
 45. Bougeard S, Qannari EM, Lupo C, Hanafi M (2011) From multiblock partial least squares to multiblock redundancy analysis. A continuum approach. *Informatica* 22: 11–26.
 46. Stone M (1974) Cross-Validatory Choice and Assessment of Statistical Predictions. *Journal of the Royal Statistical Society Series B (Methodological)* 36: 111–147.
 47. Hansson A, Giannouli P, Van Ruth S (2003) The influence of gel strength on aroma release from pectin gels in a model mouth and in vivo, monitored with proton-transfer-reaction mass spectrometry. *Journal of Agricultural and Food Chemistry* 51: 4732–4740.
 48. Pionnier E, Chabanet C, Mioche L, Le Quere JL, Salles C (2004) 1. In vivo aroma release during eating of a model cheese: relationships with oral parameters. *Journal of Agricultural and Food Chemistry* 52: 557–564.
 49. Haahr A-M, Bardow A, Thomsen CE, Jensen SB, Nauntofte B, et al. (2004) Release of peppermint flavour compounds from chewing gum: effect of oral functions. *Physiology & Behavior* 82: 531–540.
 50. Blissett A, Hort J, Taylor AJ (2006) Influence of chewing and swallowing behavior on volatile release in two confectionary systems. *Journal of Texture Studies* 37: 476–496.
 51. Tarrega A, Yven C, Sémon E, Salles C (2008) Aroma release and chewing activity during eating different model cheeses. *International Dairy Journal* 18: 849–857.
 52. Mioche L, Bourdiol P, Monier S, Martin JF (2002) The relationship between chewing activity and food bolus properties obtained from different meat textures. *Food Quality and Preference* 13: 583–588.
 53. Tarrega A, Yven C, Semon E, Salles C (2011) In-mouth aroma compound release during cheese consumption: Relationship with food bolus formation. *International Dairy Journal* 21: 358–364.
 54. Buttery R, Guadagni DG, Ling LC (1973) Flavor compounds: volatilities in vegetable oil and oil-water mixtures. Estimation of odor thresholds. *Journal of Agricultural and Food Chemistry* 21: 198–201.
 55. Doyennette M, Deleris I, Saint-Eve A, Gasiglia A, Souchon I, et al. (2011) The dynamics of aroma compound transfer properties in cheeses during simulated eating conditions. *Food Research International* 44: 3174–3181.
 56. Odake S, Roozen JP, Burger JJ (1998) Effect of saliva dilution on the release of diacetyl and 2-heptanone from cream style dressings. *Nahrung* 42: 385–391.
 57. Carpenter G (2012) Role of Saliva in the Oral Processing of Food. *Food Oral Processing*: Wiley-Blackwell. pp. 45–60.
 58. Vingerhoeds MH, Blijdenstein TBJ, Zoet FD, van Aken GA (2005) Emulsion flocculation induced by saliva and mucin. *Food Hydrocolloids* 19: 915–922.
 59. Vingerhoeds MH, Silletti E, de Groot J, Schipper RG, van Aken GA (2008) Relating the effect of saliva-induced emulsion flocculation on rheological properties and retention on the tongue surface with sensory perception. *Food Hydrocolloids* 23: 773–785.
 60. Dresselhuis DM, de Hoog EHA, Cohen Stuart MA, Vingerhoeds MH, van Aken GA (2008) The occurrence of in-mouth coalescence of emulsion droplets in relation to perception of fat. *Food Hydrocolloids* 22: 1170–1183.
 61. Prinz JF, Lucas PW (1997) An optimization model for mastication and swallowing in mammals. *Proceedings of the Royal Society of London Series B: Biological Sciences* 264: 1715–1721.
 62. Guinard JX, Zoumas-Morse C, Walchak C, Simpson H (1997) Relation between saliva flow and flavor release from chewing gum. *Physiology & Behavior* 61: 591–596.
 63. van Ruth SM, Roozen JP (2000) Influence of mastication and saliva on aroma release in a model mouth system. *Food Chemistry* 71: 339–345.
 64. van Ruth SM, Roozen JP, Cozijnsen JL (1995) Changes in flavour release from rehydrated diced bell peppers (*capsicum annum*) by artificial saliva components in three mouth model systems. *Journal of the Science of Food and Agriculture* 67: 189–196.
 65. Bennick A (1982) Salivary proline-rich proteins. *Molecular and Cellular Biochemistry* 45: 83–99.
 66. Schenkels L, Veerman ECI, Amerongen AVN (1995) Biochemical-composition of human saliva in relation to other mucosal fluids. *Critical Reviews in Oral Biology and Medicine* 6: 161–175.S